

Episode-Based Melanoma Risk Stratification Using Artificial Intelligence

Survival predictions that update every time something happens to the patient

Podlipnik S.^{1,2,3}, Luna A.^{1,2,3}, Ficapal J.⁴, Boada A.², Yelamos O.², Richarz N.², Segura S.², Martí R.M.², Quintana-Codina M.², Villar-Buil M.², Curcó N.², Azón A.², Sabat M.², Badenas C.², Formigón M.², Carrera C.^{1,2,3}, Puig S.^{1,2,3}, Malveyh J.^{1,2,3}

1 Dermatology Department, Hospital Clínic of Barcelona, University of Barcelona · 2 Xarxa Melanoma de Catalunya · 3 IDIBAPS · 4 Athena Tech, Barcelona, Spain

0.913

C-index, melanoma-specific survival
Combined episode-based model · IBS 0.040

0.886

Relapse-free survival

0.867

Overall survival

BACKGROUND

Staging tells us how risky a patient looked the day they were diagnosed. It cannot tell us how risky that same patient is today — after surgery, a recurrence, or two lines of therapy.

OBJECTIVE

Build and validate survival models that recalculate risk every time a clinically relevant event occurs, and that a clinician can inspect and explain.

METHODS

6,327

Patients with invasive cutaneous melanoma

>13,000

Clinically relevant events captured

12

Spanish institutions, 2014–2024

3.6 y

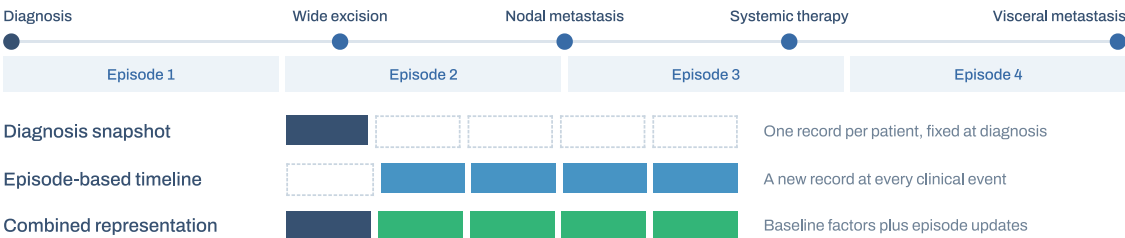
Median follow-up (inverse Kaplan–Meier)

Every clinically relevant event — diagnosis, surgery, nodal or visceral metastasis, each line of systemic therapy — was recorded and harmonised in the **Athena** platform. Each event opens a new **episode**, and survival is re-predicted from that moment onward.

Gradient Boosting Survival · left truncation and competing risks · C-index, time-dependent AUC, IBS, Brier@5y · SHAP · TRIPOD+AI.

EPISODE-BASED MODELLING

A patient's history is cut at every clinical event. Each resulting episode is a full snapshot of where that patient stands at that point in time.



RESULTS

HOW TO READ THESE NUMBERS

C-index — how often the model puts two patients in the correct order of risk. 0.50 = coin flip, 1.00 = perfect; above 0.80 is strong discrimination.

IBS / Brier@5y — average gap between predicted and observed survival, so it measures calibration, not just ranking. 0 = perfect, lower is better.

All three representations looked equally good at diagnosis. Only the episode-based ones were still accurate later in follow-up.

C-index during follow-up · melanoma-specific survival



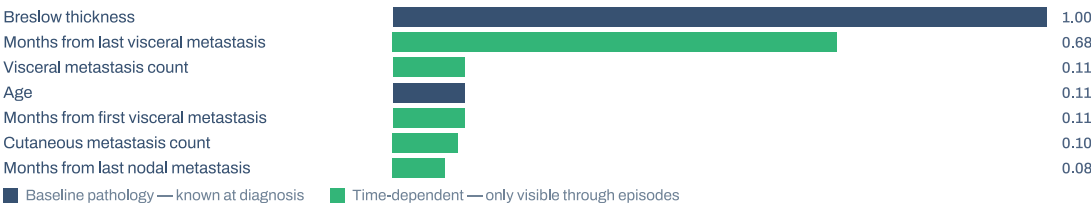
Green tick = same model measured at diagnosis (0.87). The snapshot model also lost calibration during follow-up (Brier@5y 0.303); Δ C-index +0.18 for melanoma-specific survival.

Final combined model

Endpoint	C-index	IBS
Melanoma-specific survival	0.913	0.040
Relapse-free survival	0.886	0.115
Overall survival	0.867	0.075

Clinician review of discordant cases ($\approx 6\%$) confirmed clinical plausibility.

What drives each prediction · SHAP relative importance, melanoma-specific survival



CONCLUSIONS

Risk changes during follow-up. Models built only on data from diagnosis stop being accurate; episode-based models do not.

Baseline pathology plus what has happened since gives the most accurate and best-calibrated predictions.

Every prediction is explained by named clinical variables, so it can be discussed with the patient in clinic.